

# A methodology to constrain carbon dioxide emissions from coal-fired power plants using satellite observations of co-emitted nitrogen dioxide

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# Why don't we estimate CO<sub>2</sub> emissions directly?

- Bottom-up approach:

$$\text{CO}_2 \text{ emiss}_{[\text{TgCO}_2]} =$$

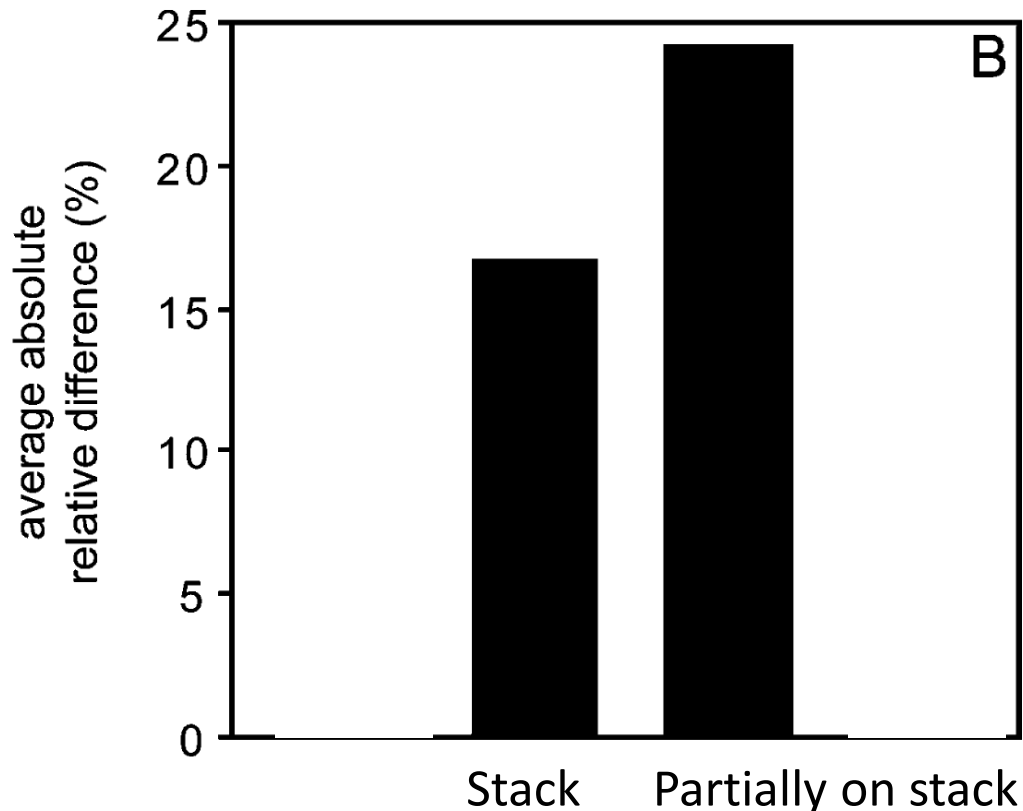
$$(\text{activity}_{[\text{MMBtu}]}) (C_{\text{coeff}, [\text{TgCQBtu}]}) (\text{oxid fact.}) (44/12) (1 \times 10^{-9})$$

- ✓ physical amount of fuel consumed multiplied by the heat content of the fuel; referred to as “heat input”
- ✓ carbon coefficient of each fuel: the amount of carbon released per unit of fuel energy consumed
- ✓ oxidation factor: the fraction of carbon that is oxidized during combustion

# Uncertainty of bottom-up CO<sub>2</sub> emissions

## Difference between EPA and EIA CO<sub>2</sub> emissions

average absolute relative difference between EPA and EIA CO<sub>2</sub> emissions reported for individual power plants for 2004



- Both the Department of Energy's Energy Information Administration (EIA) and the Environmental Protection Agency (EPA)'s eGRID database report CO<sub>2</sub> emissions for individual power plants in the US
- EIA emissions are based on **fuel data**
- EPA eGRID uses 3 monitoring methods: **stack measurement, calculation from fuel data, or a combination of the two methods**
- Estimates that are based partly or entirely on monitoring of stack gases (EPA) differed significantly from estimates based on fuel consumption (EIA).

# “direct” CO<sub>2</sub> emissions estimates

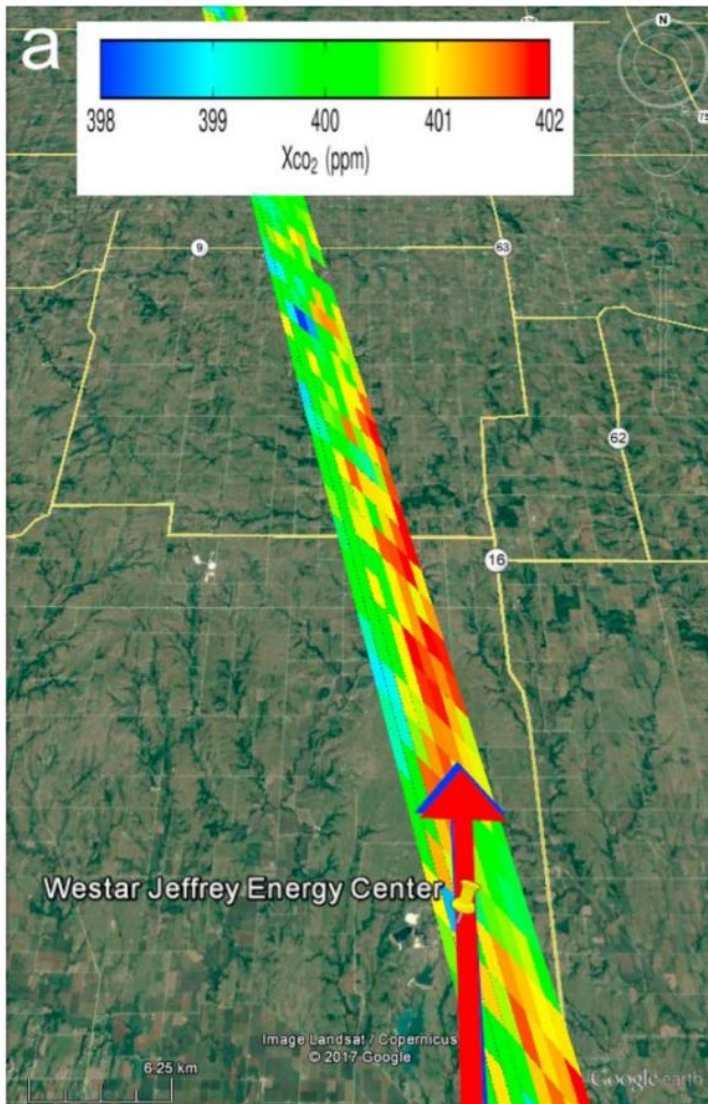
- Bottom-up approach:

$$\text{CO}_2 \text{ emiss}_{[\text{TgCO}_2]} = (\text{activity}_{[\text{MMBtu}]}) (C_{\text{coeff}, [\text{TgCQBtu}]}) (\text{oxid fact.}) (44/12) (1 \times 10^{-9})$$

- ✓ physical amount of fuel consumed multiplied by the heat content of the fuel; referred to as “heat input”
  - ✓ carbon coefficient of each fuel: the amount of carbon released per unit of fuel energy consumed
  - ✓ oxidation factor: the fraction of carbon that is oxidized during combustion
- Top-down approach:
- ✓ Satellites provide retrievals of CO<sub>2</sub> vertical columns in terms of the CO<sub>2</sub> column-averaged dry-air mole fraction, denoted by XCO<sub>2</sub>

# using XCO<sub>2</sub> to quantify emissions

## XCO<sub>2</sub> from OCO-2



- None of the existing satellite CO<sub>2</sub> sensors has been designed to monitor anthropogenic CO<sub>2</sub> emissions
- There is only a very small number of good OCO-2 overpasses for a given power plant (best case: 17 overpasses out of 2-year data)
- Estimating annual emissions requires multiple clear-sky revisits in a given year, which is likely not possible to obtain routinely from a single LEO mission

# “indirect” CO<sub>2</sub> emissions estimates: methodology

$$E_{CO_2,y}^{Sat} = \frac{E_{NO_x,y}^{Sat}}{ratio_{i,y}^{CEMS}}$$

OMI NO<sub>2</sub> observations

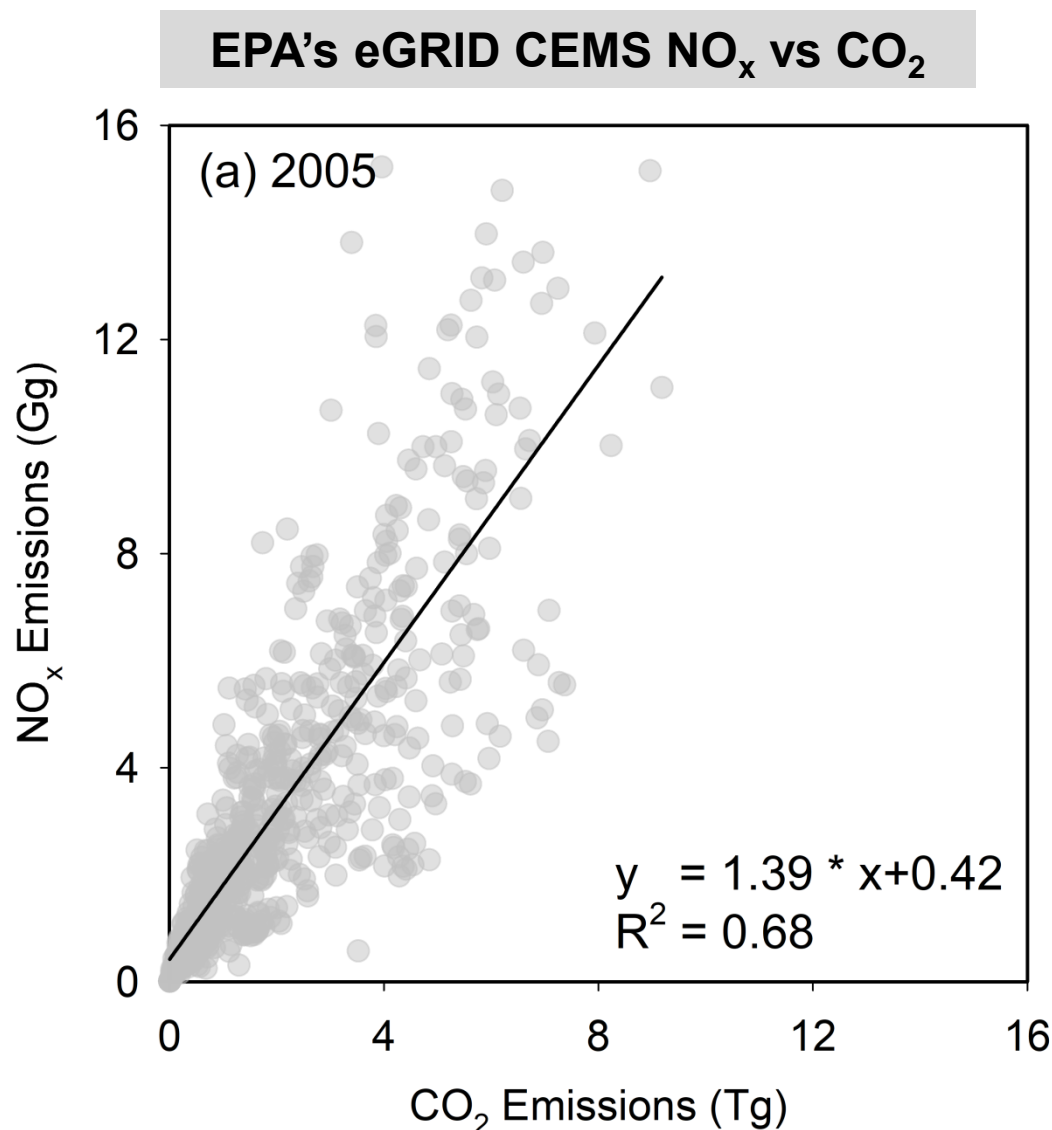
CEMS CO<sub>2</sub> and NO<sub>x</sub> emissions

- $E_{CO_2}$  and  $E_{NO_x}$  represent the satellite-derived CO<sub>2</sub> and NO<sub>x</sub> emissions, respectively.
- Ratio represents the ratio of NO<sub>x</sub> to CO<sub>2</sub> emissions for power plants

Infer NO<sub>x</sub> emissions based on OMI NO<sub>2</sub> observations:

Liu, F., Beirle, S., Zhang, Q., Dörner, S., He, K., and Wagner, T.: NO<sub>x</sub> lifetimes and emissions of cities and power plants in polluted background estimated by satellite observations, Atmos. Chem. Phys., 16, 5283–5298, doi: 10.5194/acp-16-5283-2016, 2016.

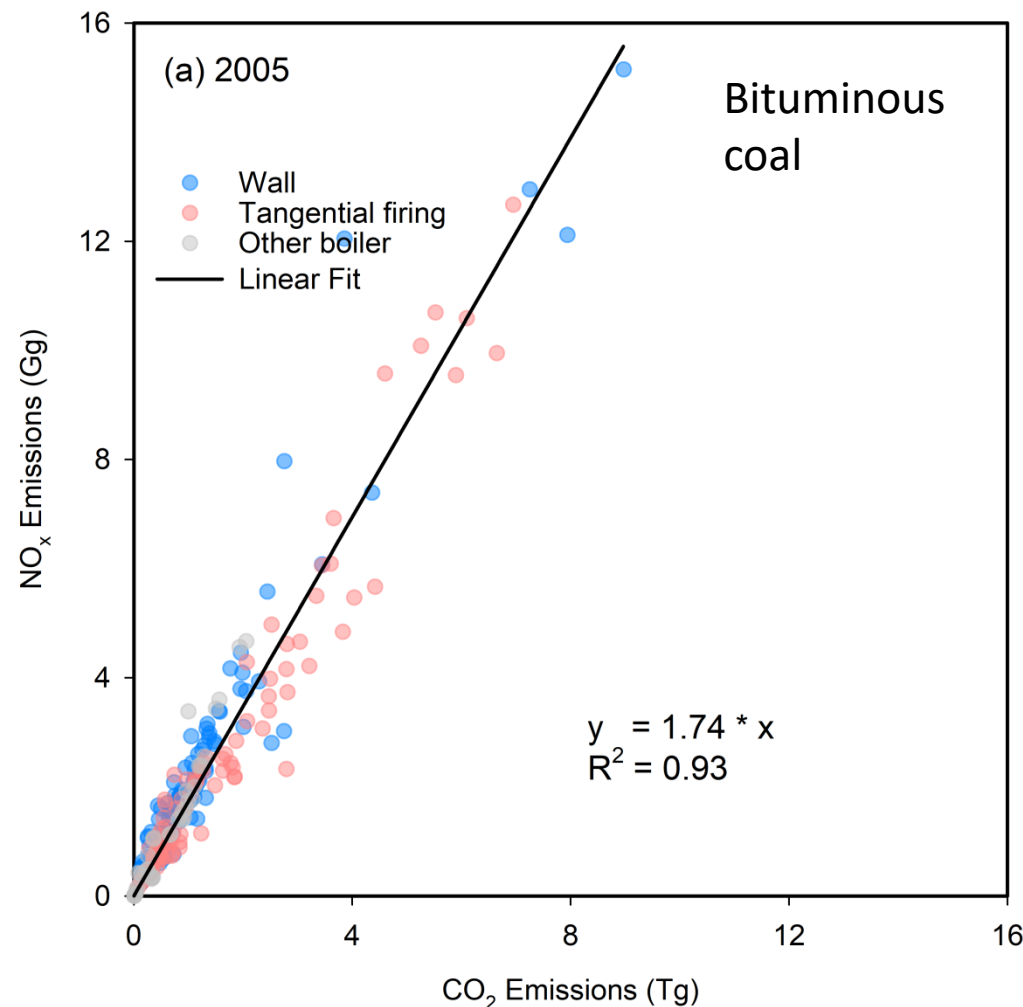
# The ratio of $\text{NO}_x$ to $\text{CO}_2$ for the US power plants



- $\text{NO}_x$  emission factors vary by coal type, firing type, and emission control device type
- For power plants installing post-combustion  $\text{NO}_x$  controls (i.e., selective noncatalytic reduction (SNCR) and selective catalytic reduction (SCR)),  $\text{NO}_x$  emission factors vary widely, as  $\text{NO}_x$  removal efficiency is plant-specific

# The ratio of $\text{NO}_x$ to $\text{CO}_2$ for the US power plants

## EPA's eGRID CEMS $\text{NO}_x$ vs $\text{CO}_2$



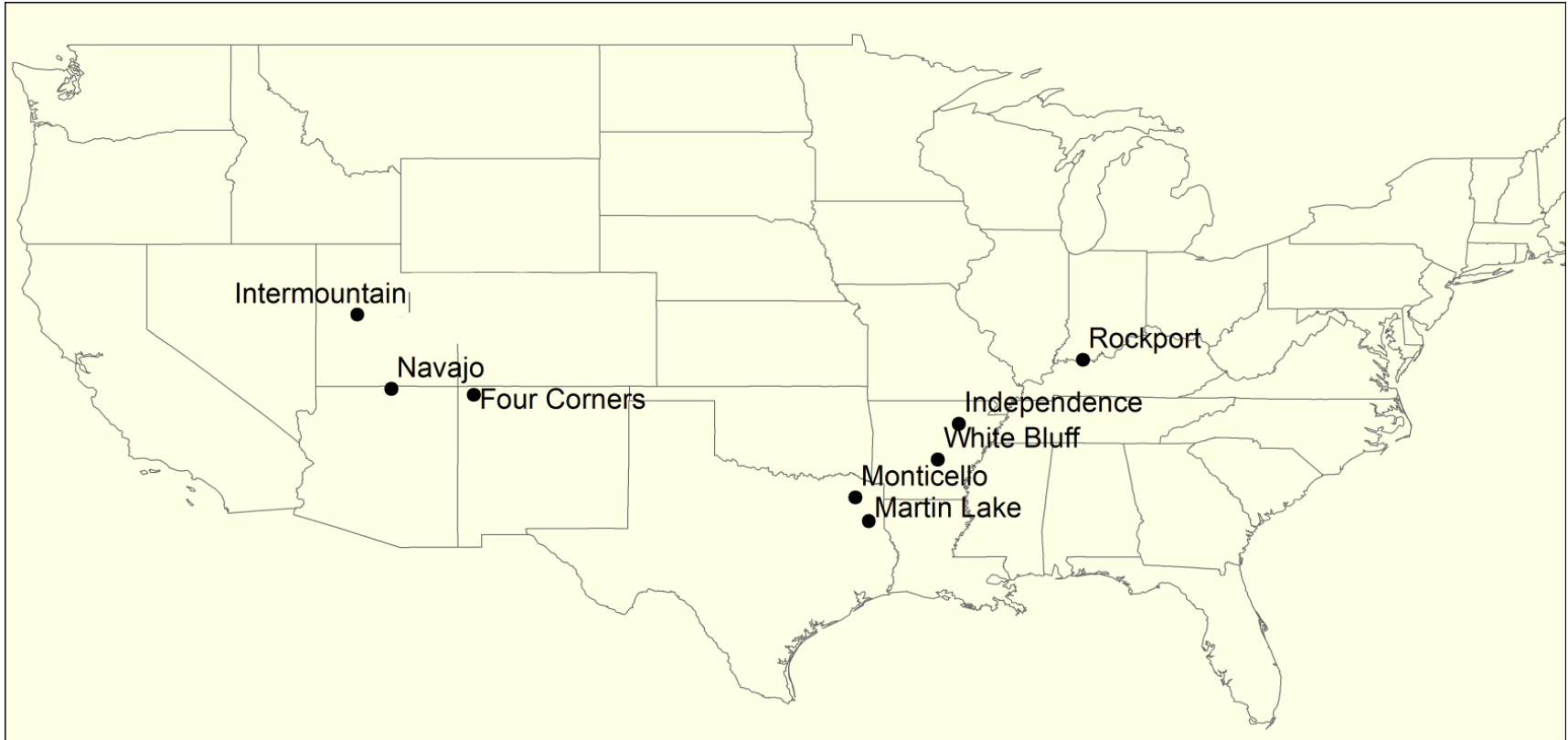
- Only power plants without installing post-combustion  $\text{NO}_x$  controls are considered
- Calculate  $\text{NO}_x/\text{CO}_2$  emissions by coal type
- $\text{CO}_2$  emissions show linear correlation with  $\text{NO}_x$  emissions



ratio of  $\text{NO}_x$  to  $\text{CO}_2$  emissions  
by coal type

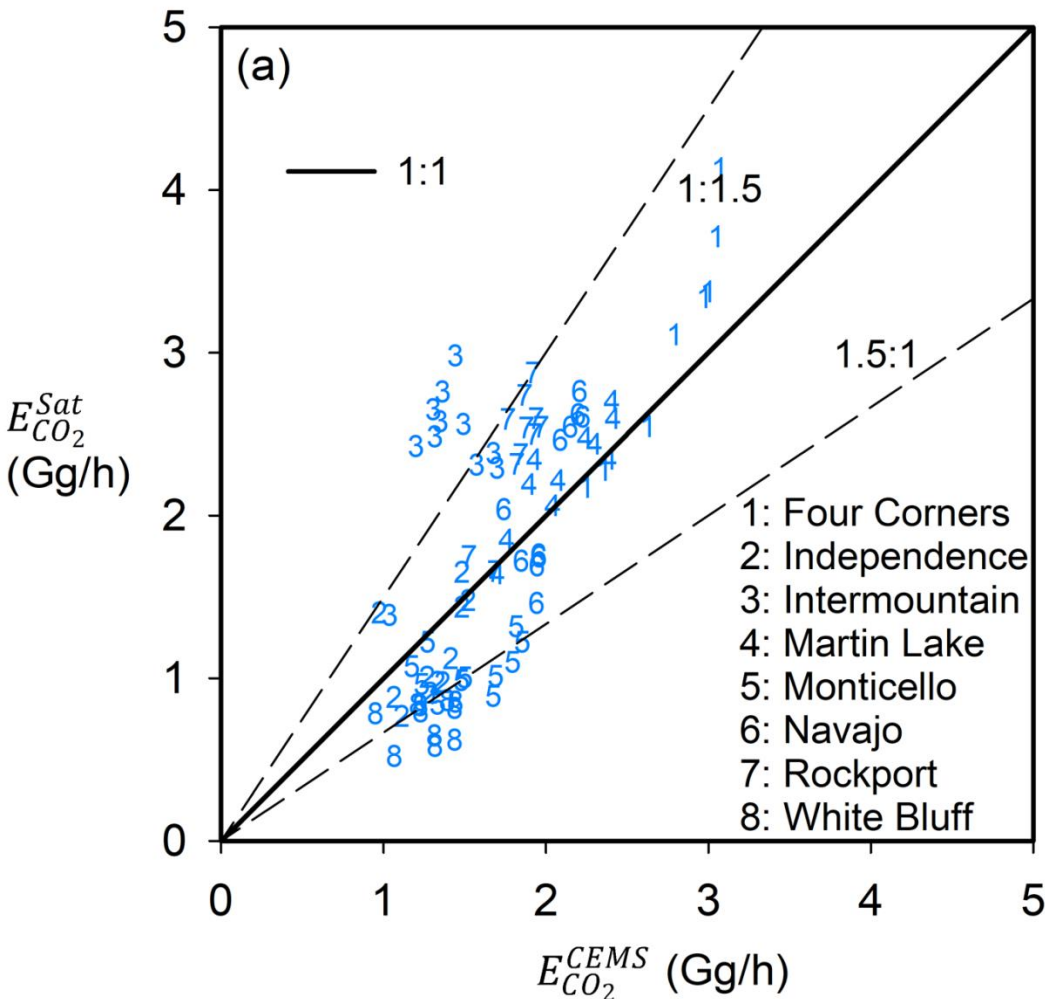


# Investigated power plants



- We chose these plants based on  $E_{NO_x}^{CEMS}$  (i.e.,  $> 10$  Gg/yr in 2005) and relative isolation from other large sources to avoid contamination of a power plant's  $NO_x$  plumes by  $NO_x$  from other sources.
- From all US coal-fired power plants, we selected 21 power plants for estimating  $E_{NO_x}^{Sat}$ .
- we are able to estimate  $E_{NO_x}^{Sat}$  for 8 of the 21 plants.

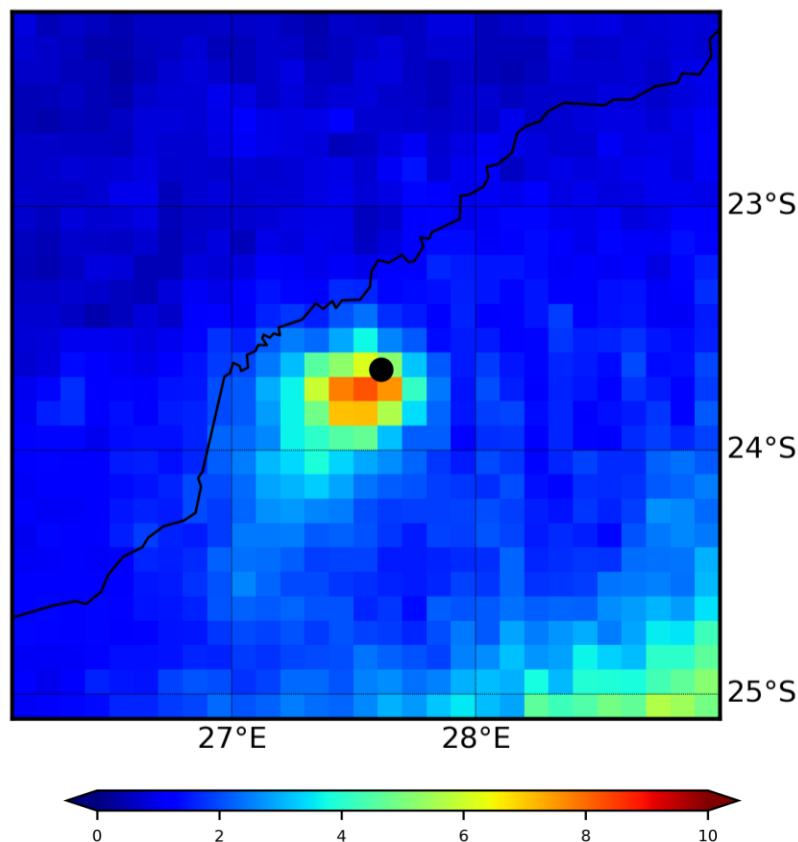
# CO<sub>2</sub> emissions based on OMI-based NO<sub>x</sub> emissions



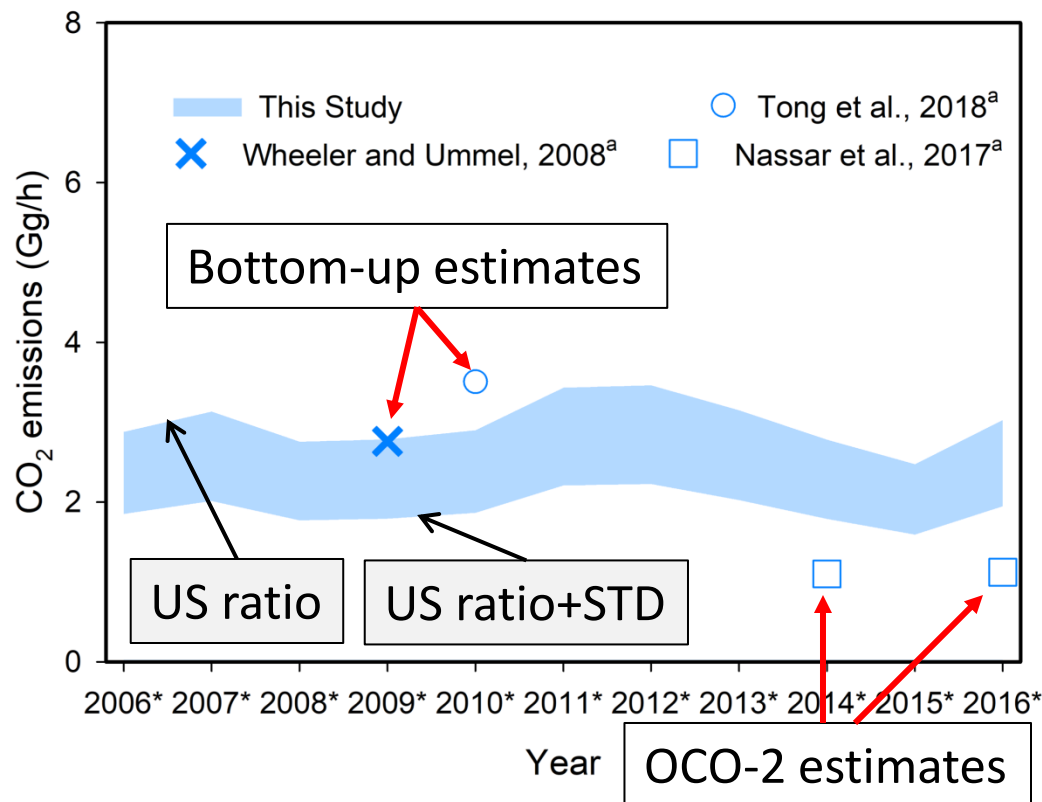
- The comparison shows a correlation,  $R^2$ , of 0.66
- relative difference for individual 3-year means (defined as  $(E_{CO_2}^{Sat} - E_{CO_2}^{CEMS})/E_{CO_2}^{CEMS}$ ) is  $8\% \pm 41\%$  (mean  $\pm$  standard deviation)

# Case study in South Africa

## Matimba power plant



## Compare with other estimates



- Matimba uses subbituminous coal
- Use the ratio ranging from 2005  $ratio_{regressed}^{CEMS}$  to 2005  $ratio_{regressed}^{CEMS} + \text{standard deviation}$  for subbituminous coal to infer  $E_{\text{CO}_2}^{\text{Sat}}$  based on  $E_{\text{NO}_x}^{\text{Sat}}$ , because the power plant is not equipped with any  $\text{NO}_x$  control devices, even low- $\text{NO}_x$  burners which are widely installed in US power plants

# Take home messages

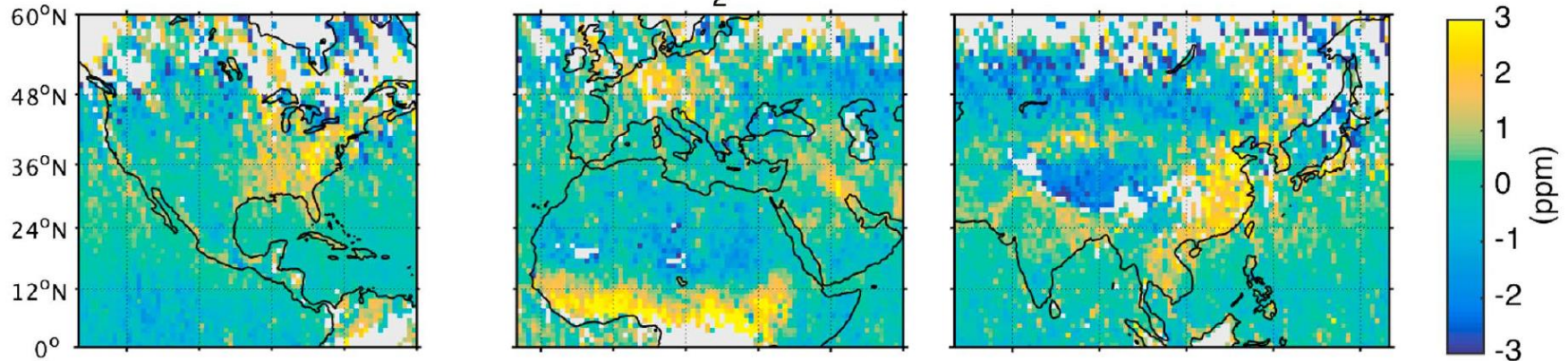
- The NO<sub>x</sub>-to-CO<sub>2</sub> emissions vary by coal types
- The OMI-based CO<sub>2</sub> emissions for the US power plants show reasonable agreement with EPA CEMS measurements
- The approach shows the capability to provide constraint on CO<sub>2</sub> emissions for regions outside the US



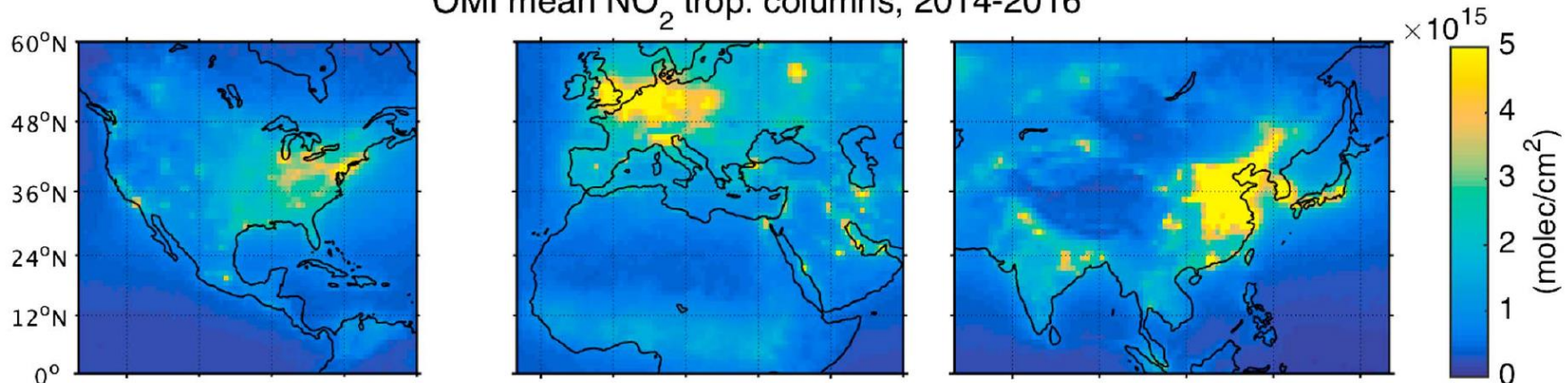
# Can we infer $\text{CO}_2$ from $\text{NO}_2$ ?

## $\text{NO}_2$ : the co-emitted species of $\text{CO}_2$

OCO-2 mean  $\text{XCO}_2$  anomalies, 2014-2016



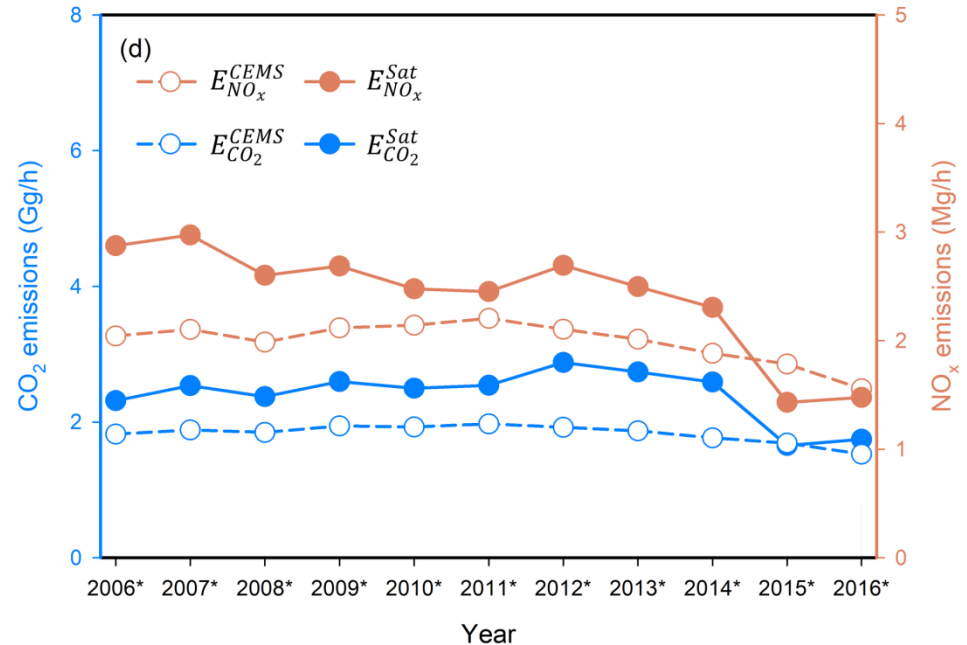
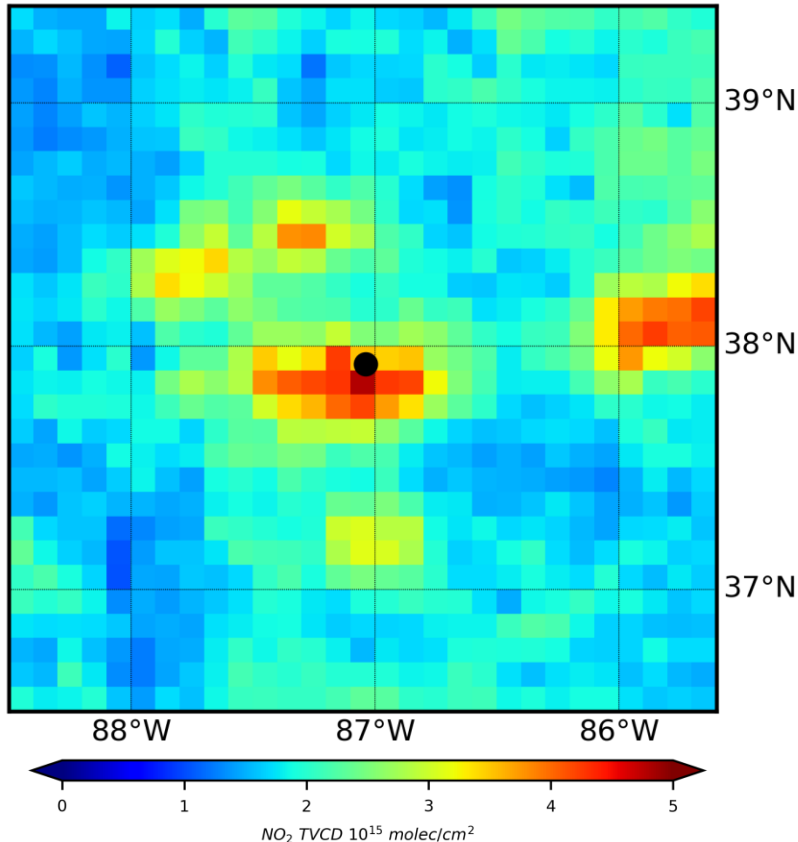
OMI mean  $\text{NO}_2$  trop. columns, 2014-2016



- The mean  $\text{XCO}_2$  anomalies match the spatial distribution of the mean  $\text{NO}_2$  tropospheric columns observed by OMI

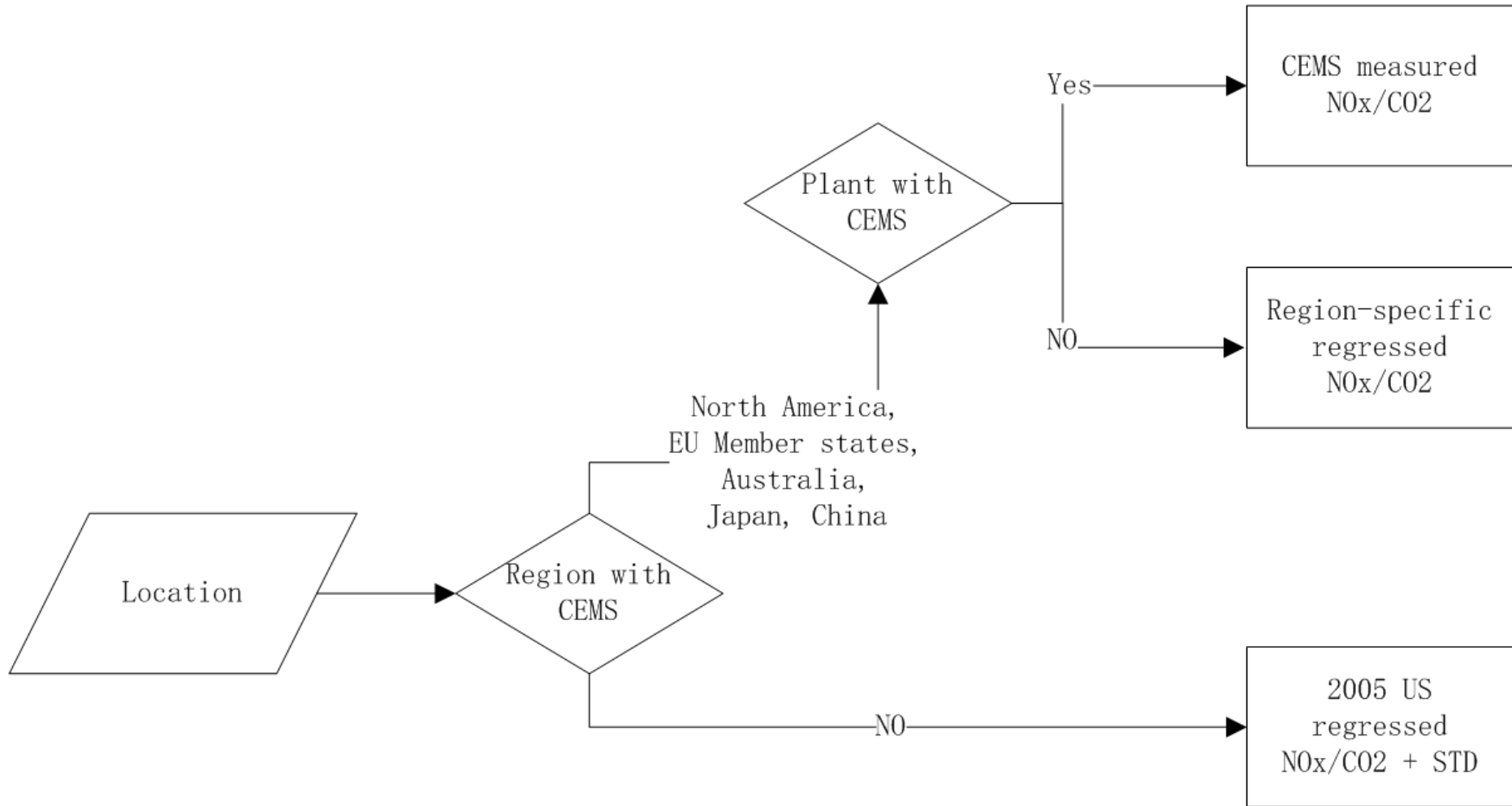
# CO<sub>2</sub> emissions based on OMI-based NO<sub>x</sub> emissions

## Rockport power plant



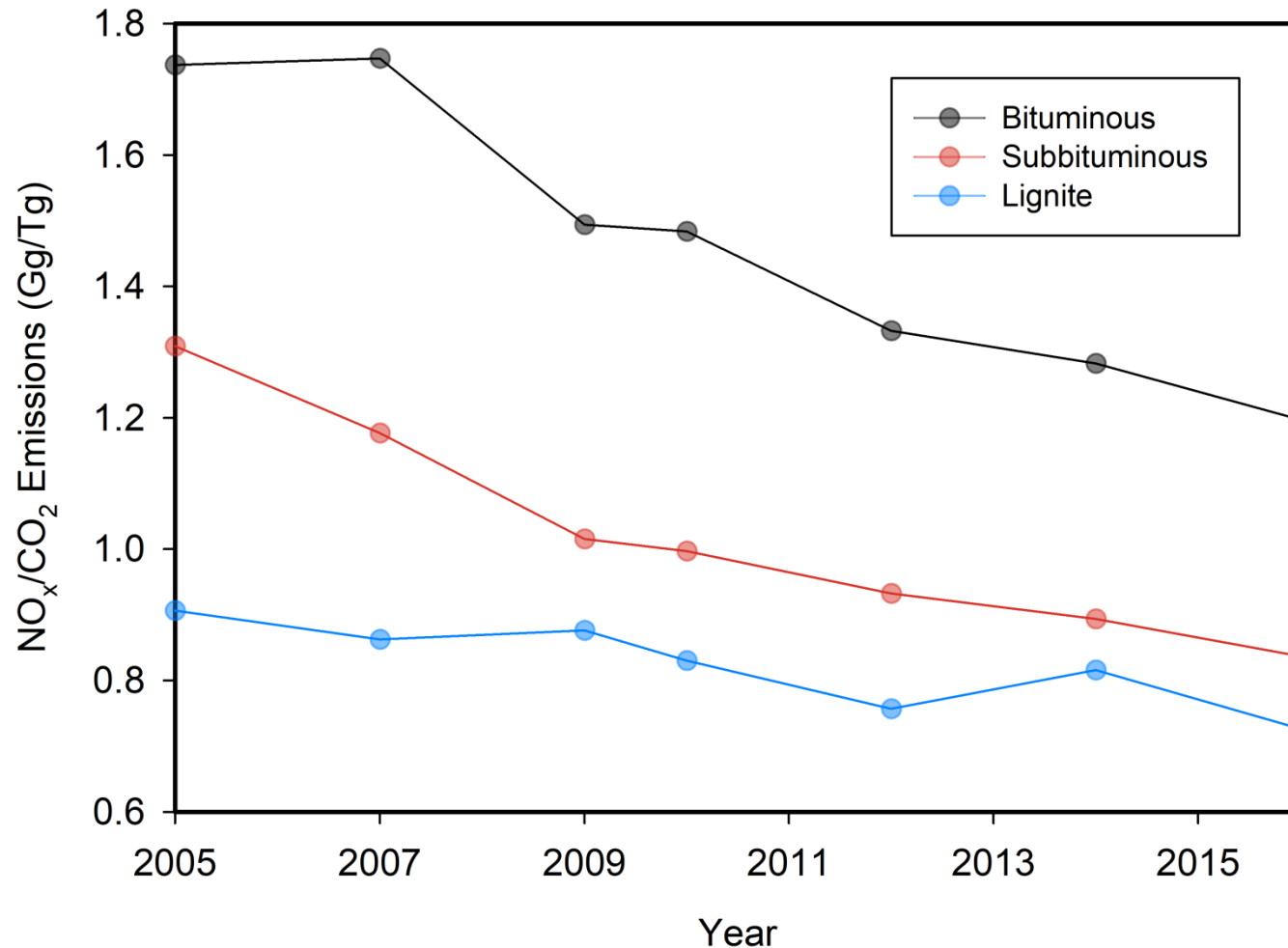
- Quantify NO<sub>x</sub> emissions based on the averaged OMI NO<sub>2</sub> TVCDs averaged over 3 years
- Quantify CO<sub>2</sub> emissions based on the ratio of NO<sub>x</sub> to CO<sub>2</sub> derived from the CEMS measurements

# Application





# Trend of the ratio of NO<sub>x</sub> to CO<sub>2</sub>



- The ratio is changing gradually driven by the improved performance of the NO<sub>x</sub> combustion controls

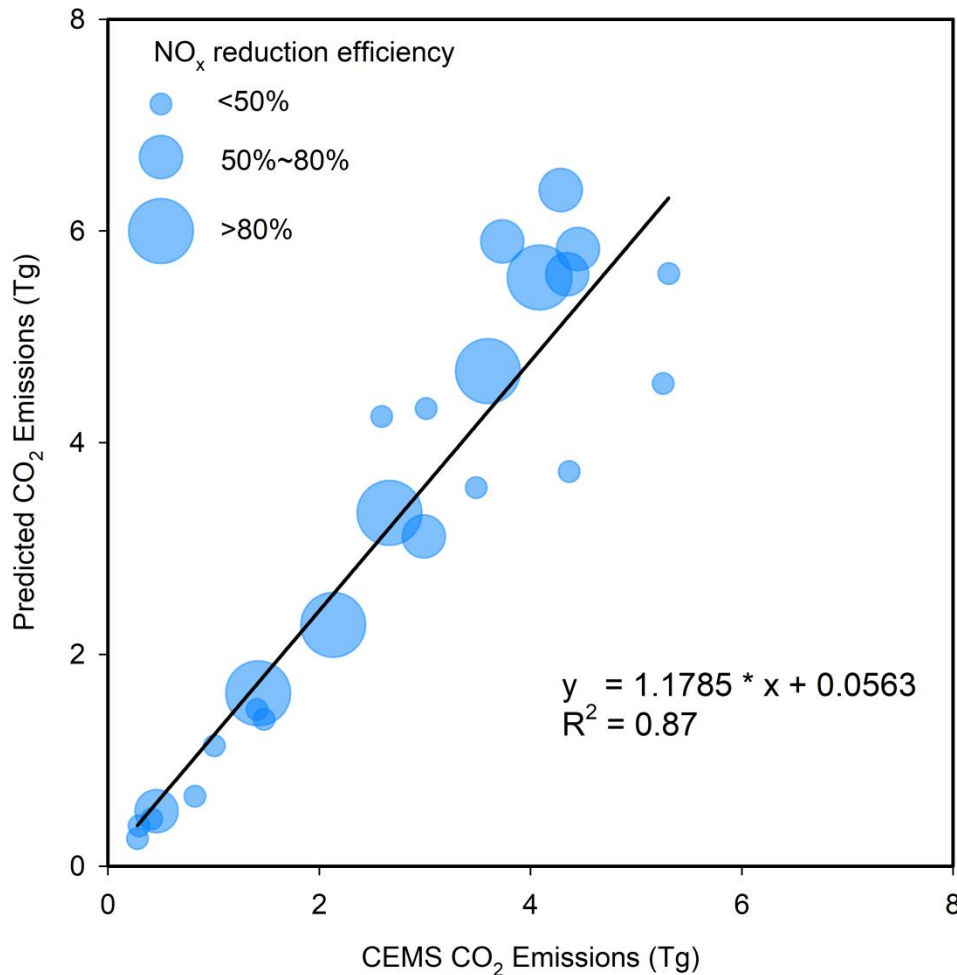
# Adjusted ratio

$$ratio_{i,y}^{CEMS-Estimated} = ratio_{regressed,i,y}^{CEMS} \times (1 - f_y)$$

- Techniques used to reduce NO<sub>x</sub> emissions are classified into two fundamentally different methods: combustion controls (e.g., low NO<sub>x</sub> burners) and post-combustion controls (i.e., selective noncatalytic reduction (SNCR) and selective catalytic reduction (SCR))
- $ratio_{regressed,i,y}^{CEMS}$  represents the ratio of NO<sub>x</sub> to CO<sub>2</sub> emissions for power plants before plumes go through SNCR/SCR
- For units installing post-combustion controls, NO<sub>x</sub>/CO<sub>2</sub> emissions vary widely
- $f$  represents the removal efficiency of the post-combustion NO<sub>x</sub> control system. If no post-combustion technique is applied,  $f$  is set to zero.

# Estimate the CO<sub>2</sub> emissions for power plants installing post-combustion control devices

We select all units using post-combustion controls in 2016, but not in 2005, to demonstrate the approach

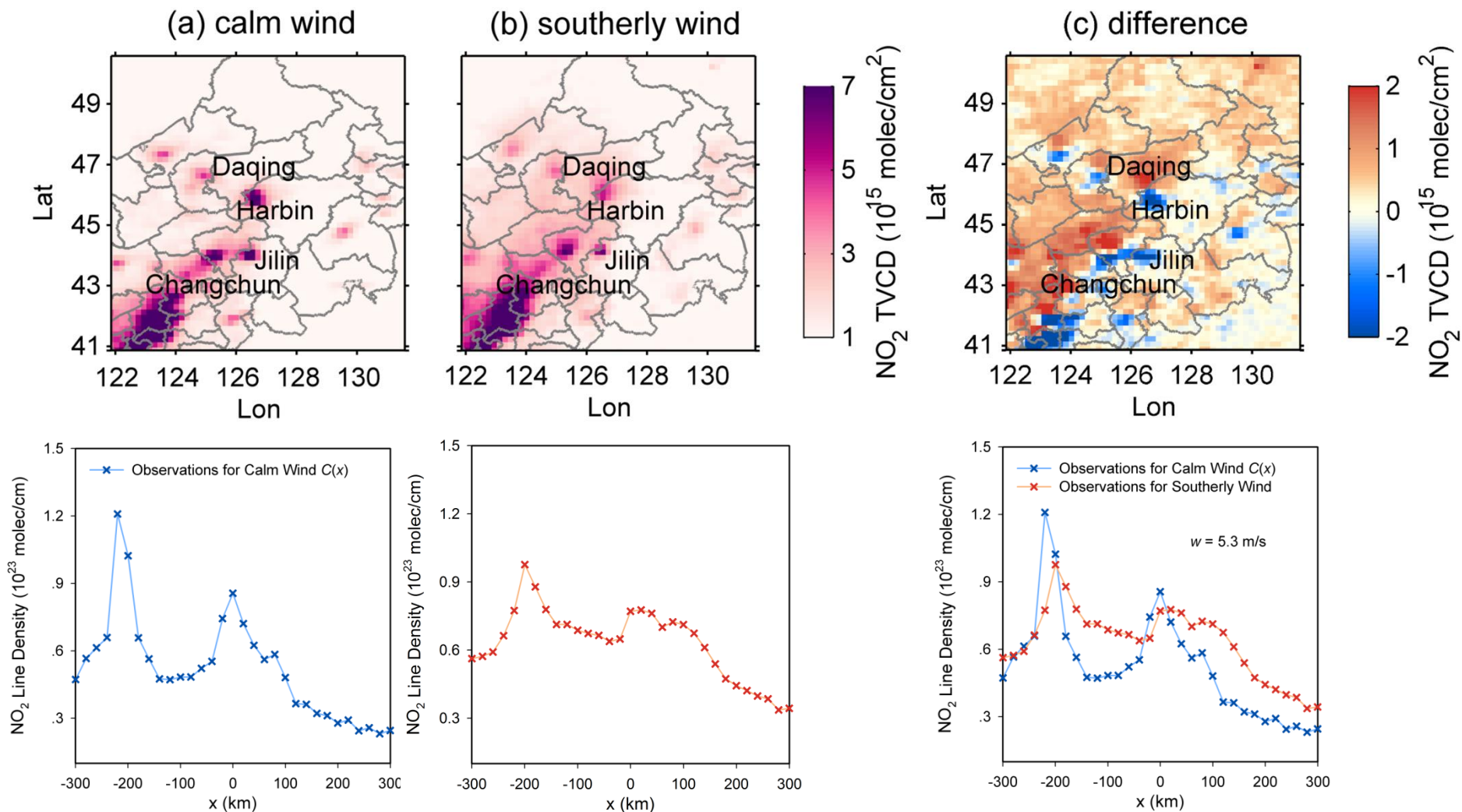


For power plants using postcombustion controls:

- NO<sub>x</sub> reduction efficiency is derived from EPA's eGRID database
- Estimate unabated NO<sub>x</sub> emissions based on CEMS NO<sub>x</sub> emissions
- CO<sub>2</sub> emissions based on the regressed ratio of NO<sub>x</sub> to CO<sub>2</sub> emissions are consistent with the CEMS CO<sub>2</sub> emissions

# NO<sub>x</sub> emissions based on OMI NO<sub>2</sub> columns

2005–2013 OMI NO<sub>2</sub> Average



Liu, F., Beirle, S., Zhang, Q., Dörner, S., He, K., and Wagner, T.: NO<sub>x</sub> lifetimes and emissions of cities and power plants in polluted background estimated by satellite observations, *Atmos. Chem. Phys.*, 16, 5283–5298, doi: 10.5194/acp-16-5283-2016, 2016.

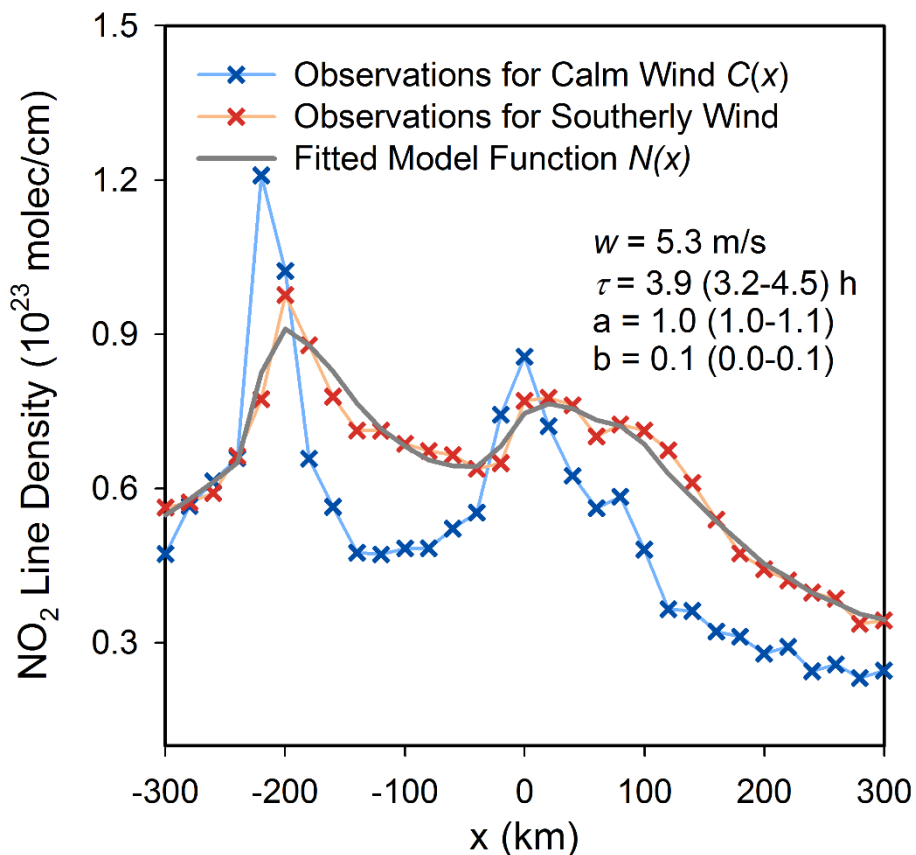
# NO<sub>x</sub> emissions based on OMI NO<sub>2</sub> columns

- Use the NO<sub>2</sub> distribution for calm wind conditions C(x) as proxy for the spatial distribution of NO<sub>x</sub> sources

- model function:

$$N(x) = a(e^{\otimes} C) + b$$

- E = total mass / lifetime



# Uncertainty of $XCO_2$

- Satellites provide retrievals of CO<sub>2</sub> vertical columns in terms of the CO<sub>2</sub> column-averaged dry-air mole fraction, denoted by  $XCO_2$
- Existing or planned satellite instruments for measuring greenhouse gases with high near-surface sensitivity such as SCIAMACHY on ENVISAT or TANSO on the Greenhouse Gases Observing Satellite (GOSAT) aim primarily at providing additional constraints on natural CO<sub>2</sub> sources and sinks. None of the existing satellite CO<sub>2</sub> sensors has been designed to monitor anthropogenic CO<sub>2</sub> emissions
- The capacity of GOSAT and OCO-2 observations to detect anthropogenic CO<sub>2</sub> emissions from point sources is limited